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## 1.1 Role and Stages of Mathematical Modeling

Mathematical modeling is a vital component of scientific research and policy making. Its effectiveness has been proven for centuries. The modeling provides an explanation and prediction of the behavior of complex economic and environmental systems and helps to obtain new theoretical knowledge about the nature and society. The concept of the economic–environmental system assumes the influence of both the economy and environment on each other and the possibility of human control in the system [7]. The importance of modeling of such systems increases proportionally to the scale of human impact on the environment.

Mathematical modeling and computer simulation have a special place among scientific methods. The advantages of modeling as compared to experimentation are as follows:

- Universal availability and applicability of modeling tools.
- Low costs and short timeline of the modeling process.
- Multiple simulations on a wide range of model parameters (“what-if” analysis).
- Possibility of making various model modifications and improvements.
- Evading negative outcomes of real experiments, and others.